#### Simulating the Universe

Martin White UCB

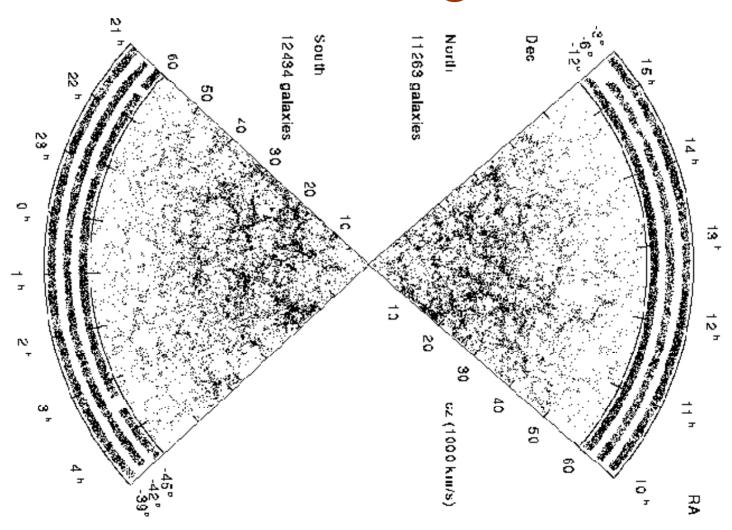
#### Outline

- Overview of cosmology
- The role of simulations
- Physics and algorithms
- Some examples
- The future ...

#### Cosmology overview

- When we observe the universe we see a wealth of structure on essentially all scales.
  - Stars cluster into galaxies
  - Galaxies into clusters of galaxies,
  - Clusters into super-clusters
  - And so on.

# Large-scale structure in the distribution of galaxies

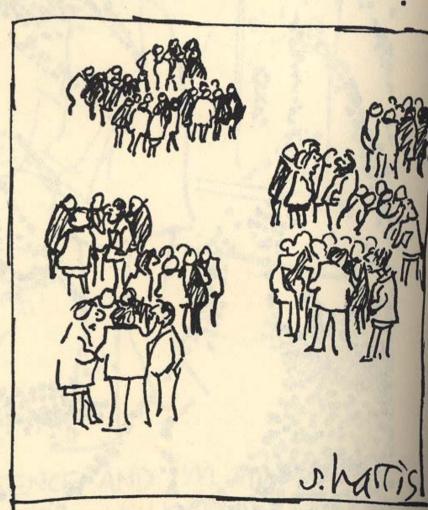


THE RESEARCH CONTINUES ...

PO COSMOLOGISTS FORM CLUSTERS?...



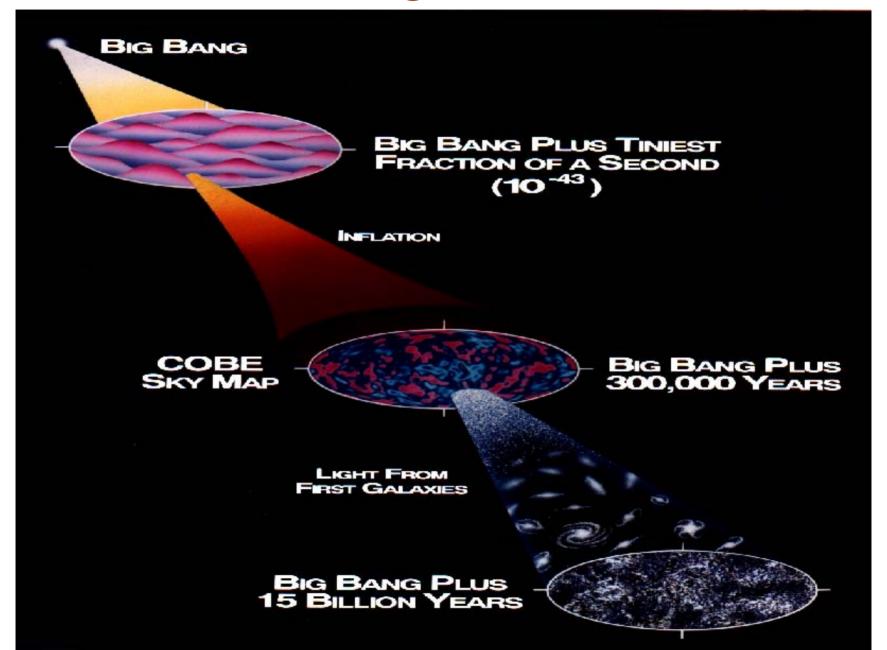
... AND DO THE CLUSTERS FORM SUPERCLUSTERS?



# The most beautiful story in Physics:

- We believe that these cosmic structures had their origins in quantum fluctuations generated during the early universe.
- These fluctuations were amplified by gravitational instability.
  - we see them as tiny fluctuations in the temperature of the relict radiation left over from the big bang (t~300,000 yr),
  - ... and as correlations in the distribution of galaxies today ( $t\sim10^{10}$  yr).

#### The Big Picture



#### Gravity is the Engine of Growth

- The dominant force is gravity, the dominant component is (collisionless, non-interacting) "dark matter".
- On scales <1 Mpc gas pressure forces become increasingly relevant.
- Galaxies form in dark matter halos, but their properties are dominated by gastrophysics.

#### Evolution of structure

QuickTime™ and a Cinepak decompressor are needed to see this picture.

## The role of simulations in cosmology ...

- Many problems in astrophysics lack the symmetries that generally allow analytic solution.
   A full 3D numerical treatment is required.
- Numerical simulations play a key role in cosmology.
- In cosmology know both the PDEs *and* the initial conditions!
- Ab initio calculations are possible (in principle)

#### We are using simulations to ...

- Understand the evolution of galaxy clustering (DEEP2, VIRMOS, ...)
  - Mock galaxy catalogues, galaxy formation models.
- Make predictions for weak lensing surveys.
  - Model non-linear evolution of DM.
  - Affects high-z supernovae, constrains DE!
- and the Sunyaev-Zel'dovich effect
  - Simulated observations for experiments.
  - Basic theory.
- Quantify merger rates of galaxies and black holes
  - Main gravity wave source for LIGO, LISA, ...
- Elucidate the structure of our dark matter halo
  - Direct detection experiments
- Study small-scale structure (Ly- $\alpha$  forest)
  - Strong limits on DM properties (& dark energy?)

#### Types of physics included ...

- Gravity
  - All cosmology codes have this! Dominates the forces above the scale of galaxies.
- Hydrodynamics
  - Adiabatic physics
  - Cooling
  - Star "formation" and feedback
- Magnetic fields (MHD)
  - Not so common in cosmology.
- Radiative transfer
  - Still early days ...

#### Gravity: the N-body method

- Original N-body work was for stellar systems (a true "N-body problem").
- Taken over to cosmology change in emphasis: now modelling DM dominated systems as a **fluid**.
- Need to solve the *Vlasov Equation* or collisionless Boltzmann equation...

#### Monte-Carlo

- Solve this 6N-dimensional equation using Monte-Carlo techniques.
- Sample phase space with a set of N>>1 "superparticles".
- If superparticles follow characteristics of the Vlasov equation (in expanding universe) then distribution function is correctly evolved.
- It's not about orbits, it's about N!!

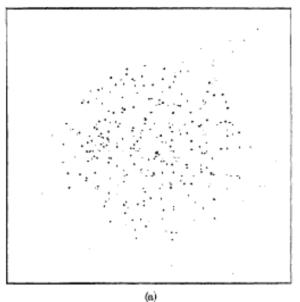
#### The first N-body simulations ...

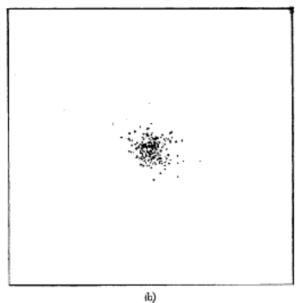


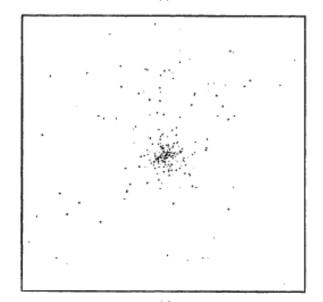
Erik Holmberg (1941)

2D, N=74

#### ... in cosmology ...





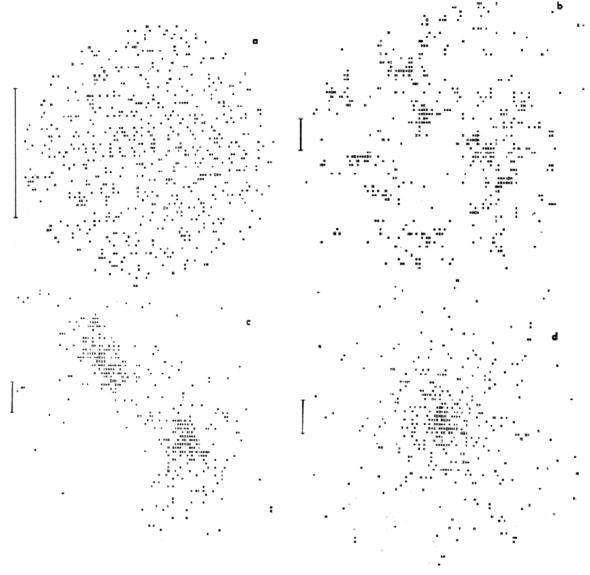


#### Jim Peebles (1970)

Fig. 1. Model 1 positions: (a) initial positions, t-28 b.y.; (b) t=5.6 b.y.; and (c) t=8.4 b.y.

N=300 (3D)

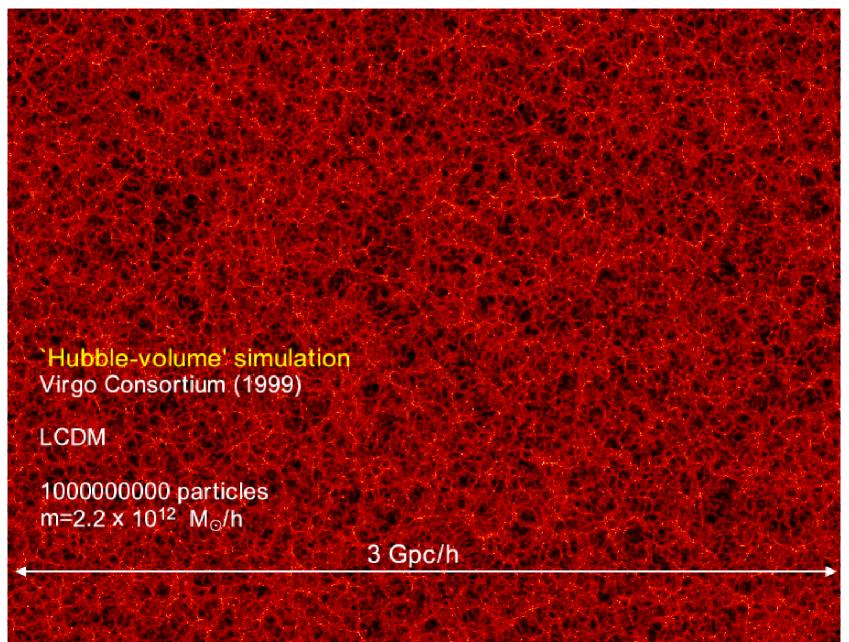
#### ... with 'realistic' ICs:



Simon White (1976)

N=700 (3D)

#### The state of the art ...



#### The approach

- Lay down particles with positions and velocities determined by early universe theory.
  - Can be random realization or
  - Constrained realization
- Evolve positions and velocities (using low order integrator) using Newton's laws (generalized to an expanding universe).
- Smooth forces to reduce 2-body scattering.

### Computing the forces

Direct summation	O(N <sup>2</sup> ) [Special hardware]	Practical for N<10 <sup>4</sup>
Particle mesh	O(N logN)	Uses FFTs to invert Poisson equation.
Tree codes	O(N logN)	Multipole expansion.

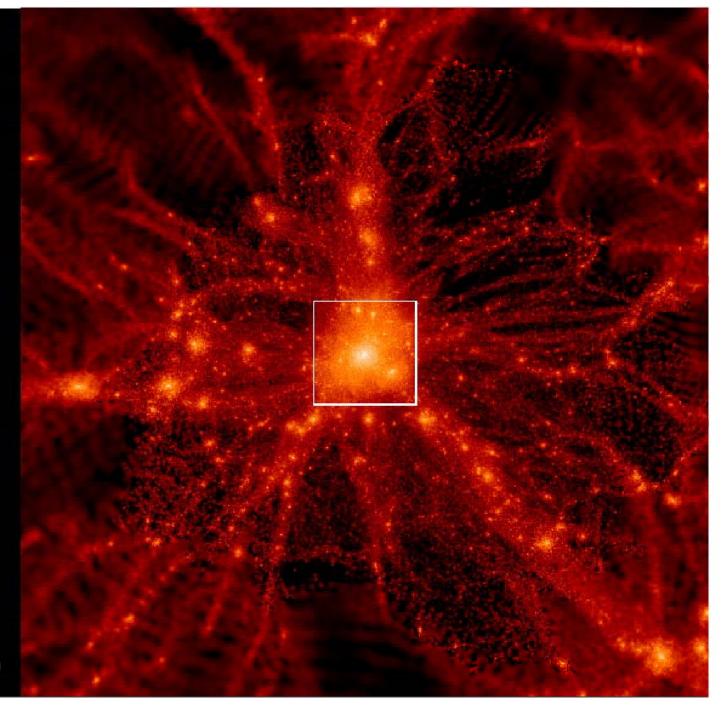
All modern methods are hybrids of these!

### Large-scale structure arises from Gaussian initial conditions seeded by inflation $$\Lambda{\rm CDM},\,N=2\times224^3$$

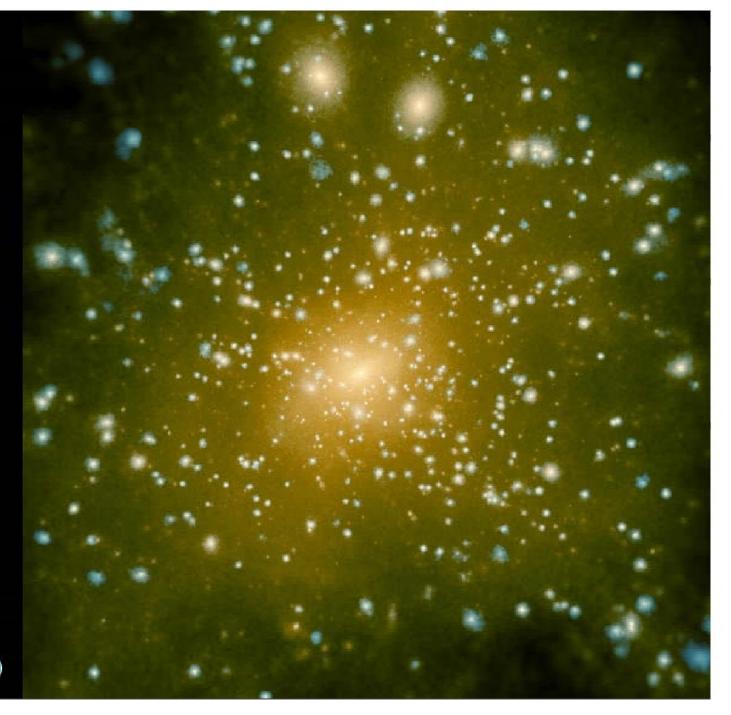
 $134 \times 134 \times 22.3 \, (h^{-1}{\rm Mpc})^3$ **EVOLUTION OF STRUCTURE** z = 15.57 z = 0.00

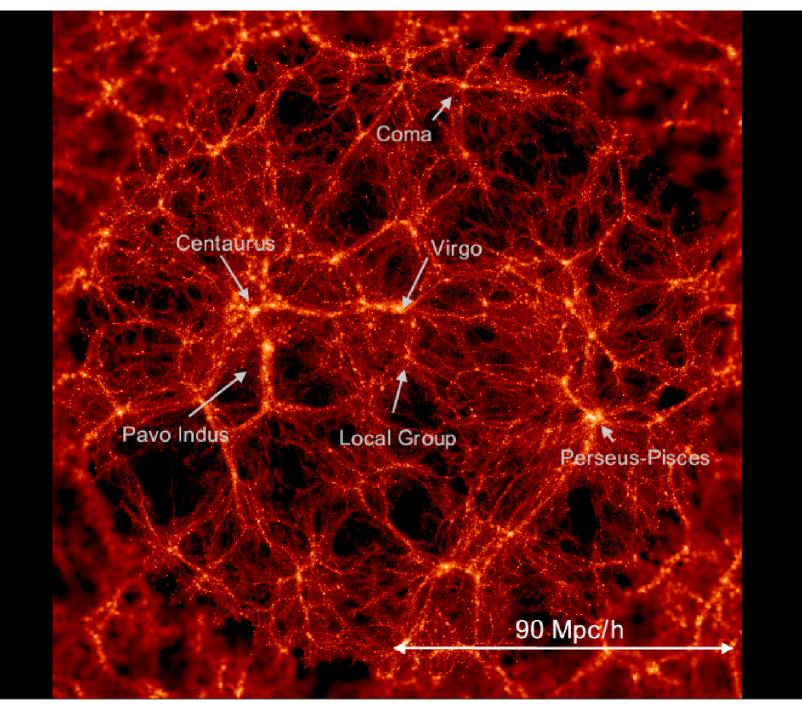
Springel, Hernquist & White (2000)

Zooming in on a cluster of galaxies



Zooming in on a cluster of galaxies





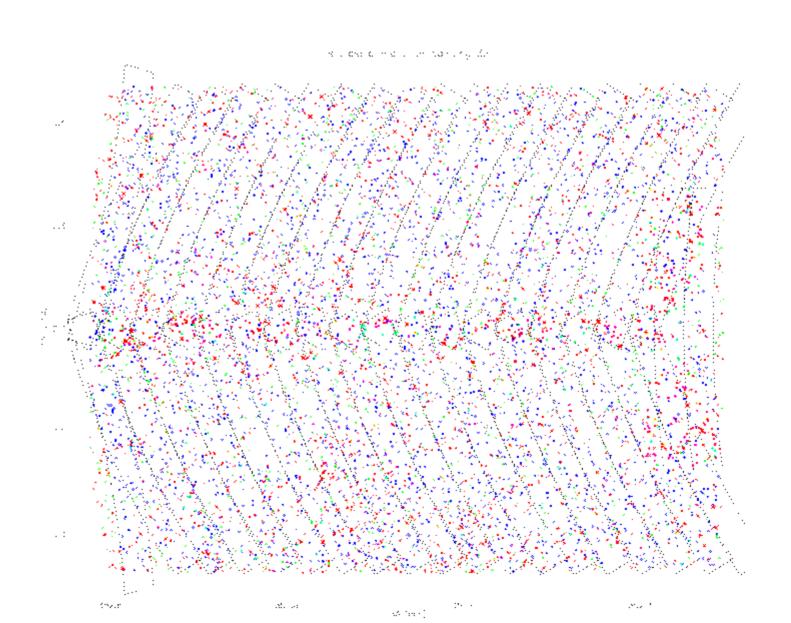
## Applications of large-scale simulations

- Simulations are now routinely used to analyze almost all situations in cosmology.
- Four examples
  - Mock redshift surveys
  - Gravitational lensing
  - Sunyaev-Zel'dovich effect(s)
  - Ly-α forest

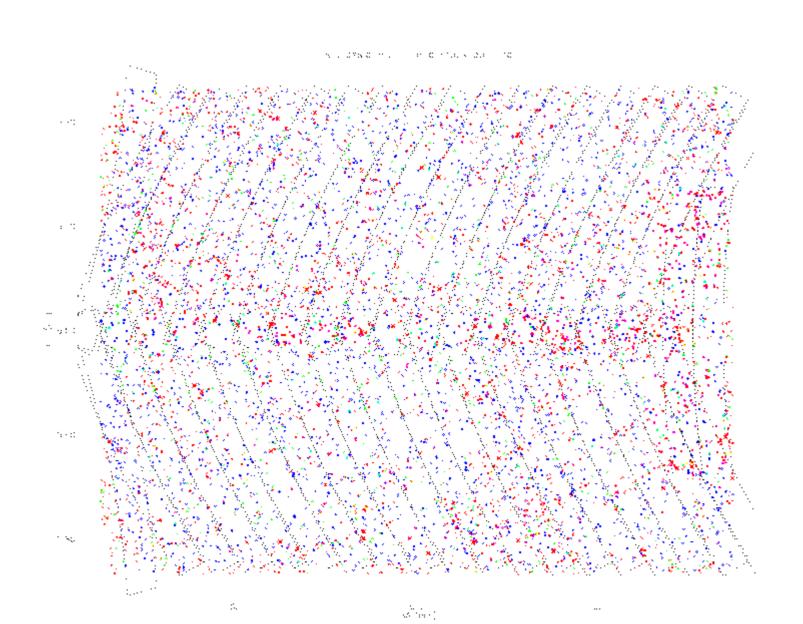
#### Modern redshift surveys

- Modern redshift surveys routinely make use of mock catalogues to
  - Design the survey strategy.
  - Tune and calibrate algorithms.
  - Correct data products for survey artifacts.
- Example: the DEEP2 survey...

### Mock DEEP2 surveys

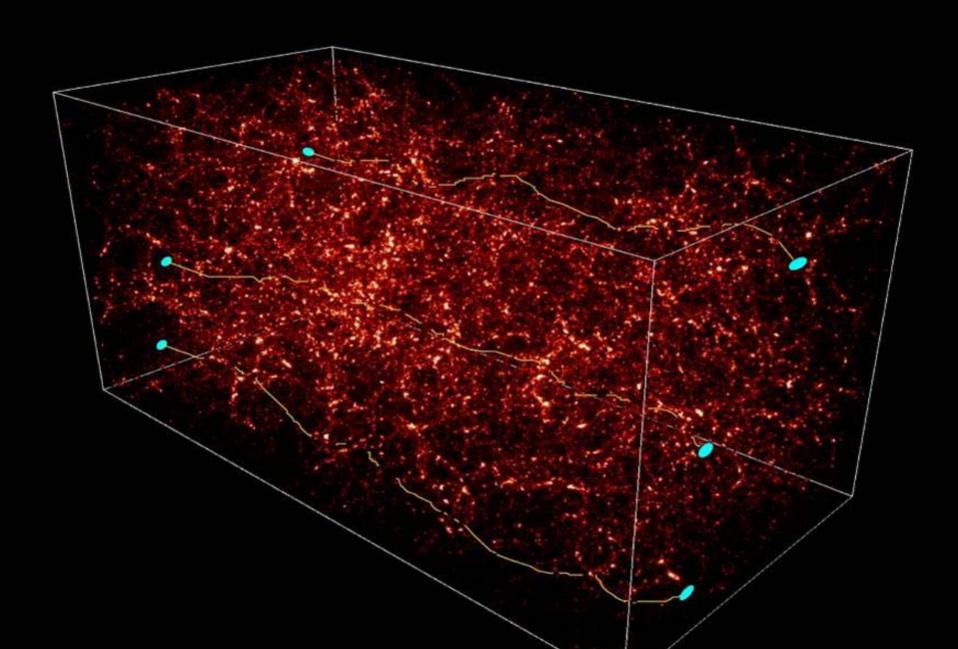


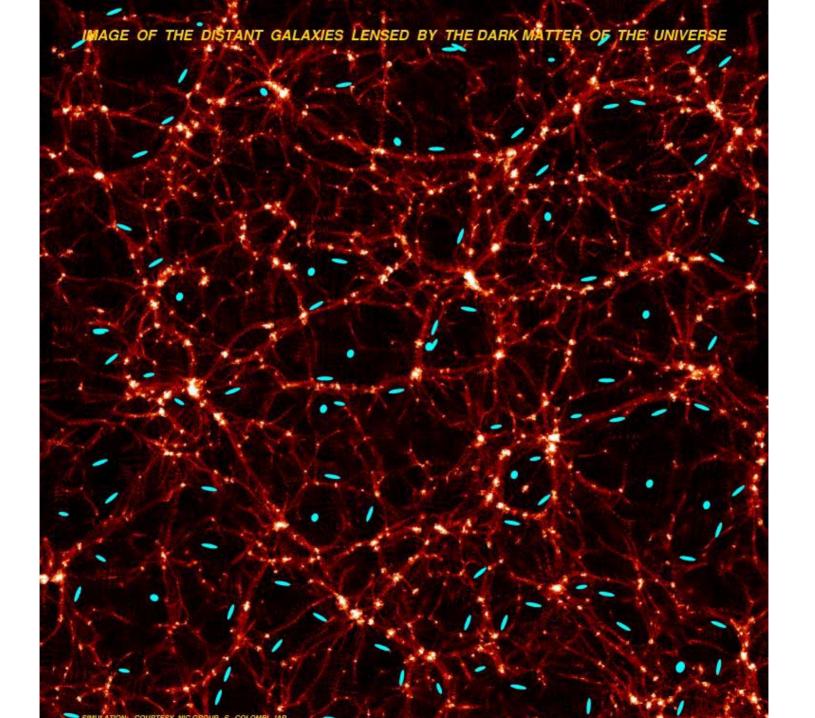
### Mock DEEP2 surveys



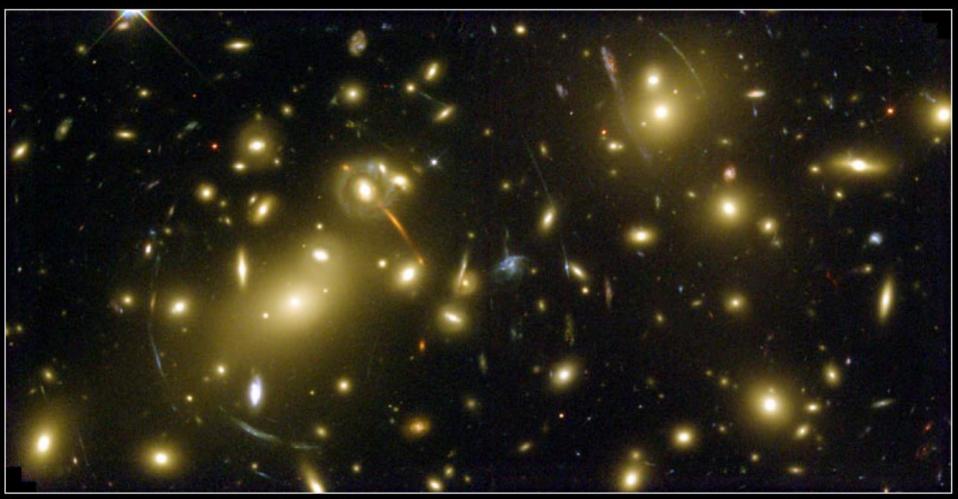
#### Ways to find: Clusters of Galaxies

- Largest structures in the universe: mountains of the cosmos!
- Provided first evidence for dark matter.
- In a universe wherein structure formed hierarchically
  - Small things form first and merge or accrete other small things to get bigger
- the largest objects are special.
- Most sensitive to our modelling assumptions.





#### Gravitational lensing in A2218

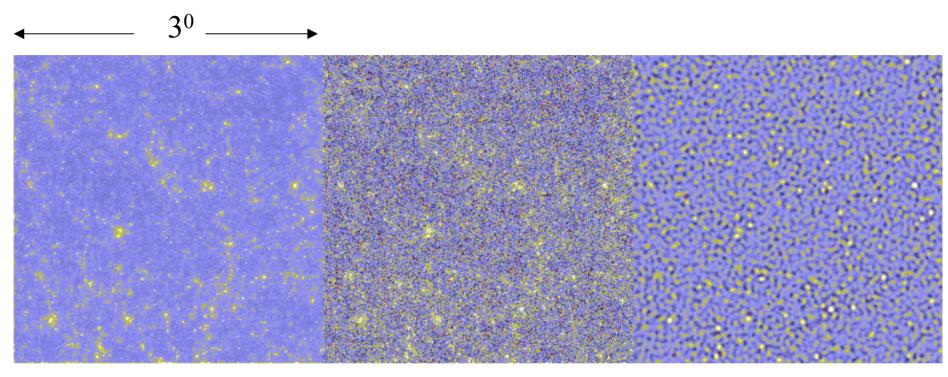


Galaxy Cluster Abell 2218

**HST • WFPC2** 

NASA, A. Fruchter and the ERO Team (STScl, ST-ECF) • STScl-PRC00-08

#### Weak lensing maps: simulations



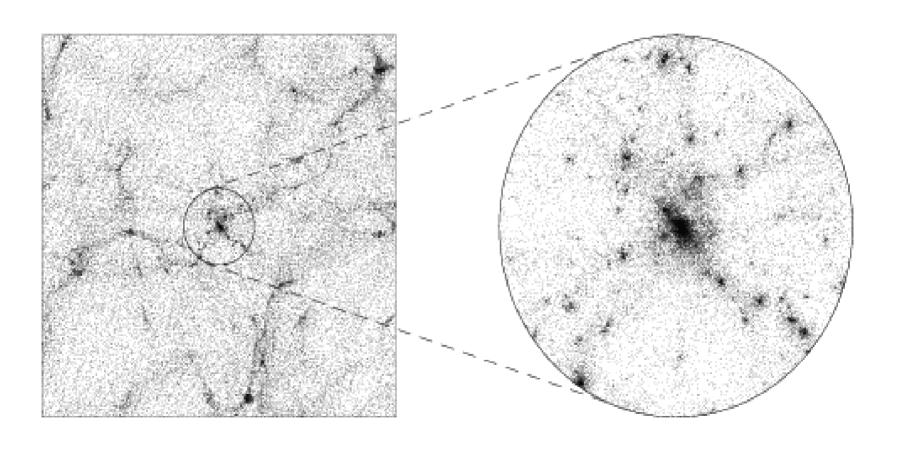
Raw convergence map – roughly projected mass.

+ noise from shear reconstruction

Filtered

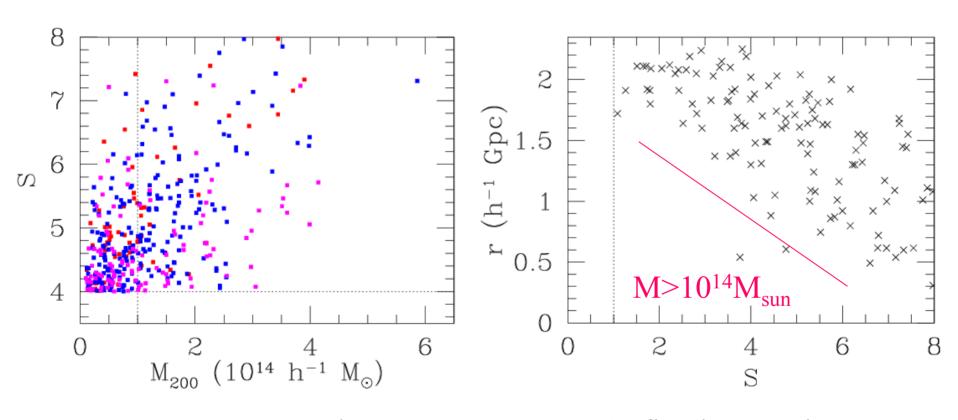
White, van Waerbeke & Mackey (2002)

## Clusters are part of large-scale structure



Metzler, White & Loken (2001)

#### Lensing scatterplots



Large scatter means low completeness

At fixed mass the threshold is distance dependent!

# Clusters can "hide" among the projected large-scale structure.



"Now calm down, Barbara. ... We haven't looked everywhere yet, and an elephant can't hide forever."

### Adding gas ...

- Beyond gravity hydrodynamics!
- Two main approaches
  - Grid based (Eulerian)
    - Mostly regular grids, often with refinement
    - PPM or TVD schemes
  - Particle based (Lagrangian)
    - SPH, often with adapative smoothing
- Gravity is always done with particles

## The Sunyaev-Zel'dovich Effect(s)

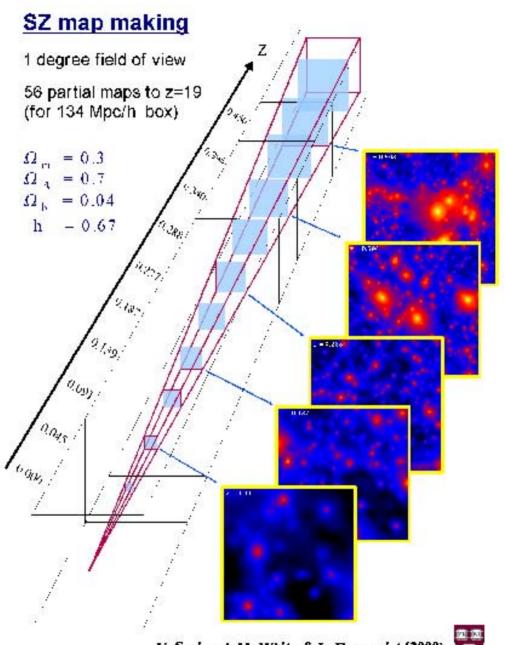
- Compton scattering of CMB photons by hot gas along line-of-sight.
- Upscattering of CMB photons leads to ~mK temperature decrements in CMB at low frequency.
- Signal dominated by clusters of galaxies.
- Measures total internal energy of cluster.
- Dominant secondary anisotropy.
- Independent of redshift!

### New observational handles ...

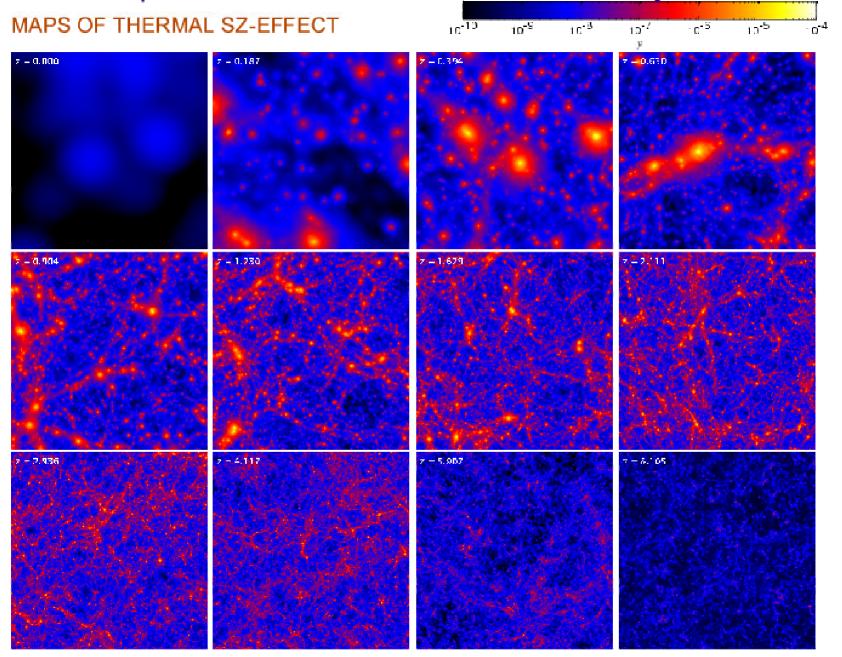
Name	Type	Beam	Cluster
		(arcmin)	Yield
ACBAR	Bolo	4	Few
Bolocam	Bolo	1	10's
SZIE	HEMT	1	100's
CBI	HEMT	4	100's
AMI	HEMT	1	100's
Amiba	HEMT	1	100's
APEX	Bolo	0.75	5,000
SPT	Bolo	1	20,000
Planck	Bolo	5	10,000
ALMA	HEMT		

Simulations with adiabatic hydrodynamics trace shock heating of gas in the IGM and in halos

RAY-TRACING CAN BE USED TO OBTAIN PREDICTIONS FOR SECONDARY ANISOTROPIES OF THE CMB

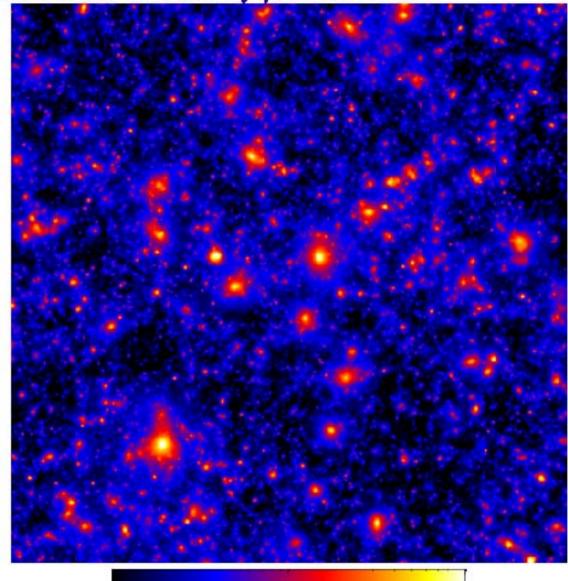


#### Partial maps of thermal SZ-effect show filamentary structure

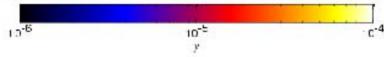


The thermal SZ effect is dominated by point sources

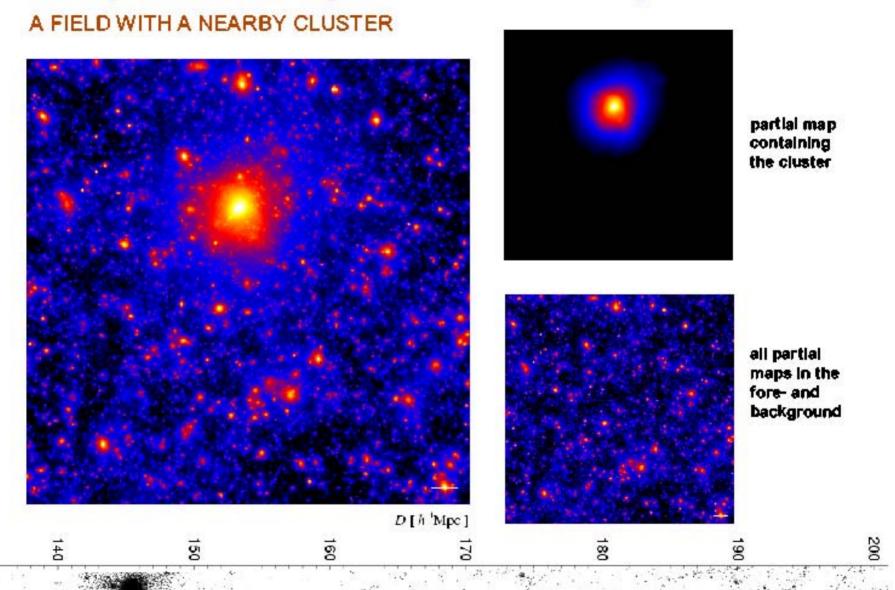
COMBINED MAPS



 $1^{\rm o}\times 1^{\rm o}$  field,  $\Lambda{\rm CDM}$   $N=2\times 224^{\rm 3},\, L=134\,h^{-1}{\rm Mpc}$ 

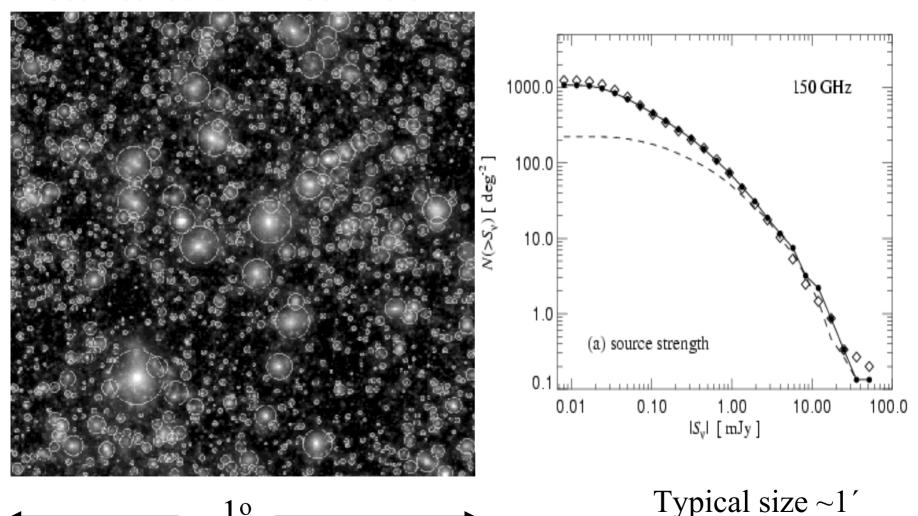


### Nearby clusters are huge SZ sources on the sky

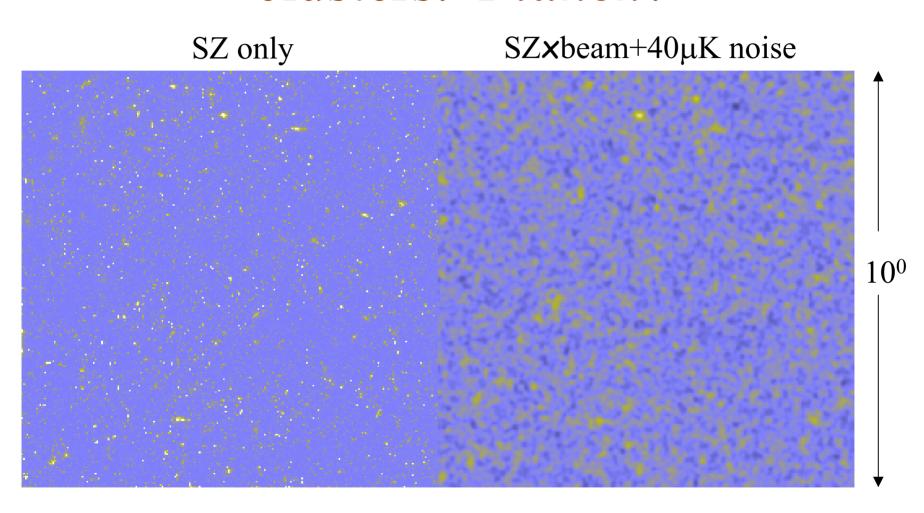


## Probing massive halos ...

#### Sources found with Sextractor



# An all-sky survey for massive clusters: *Planck*?

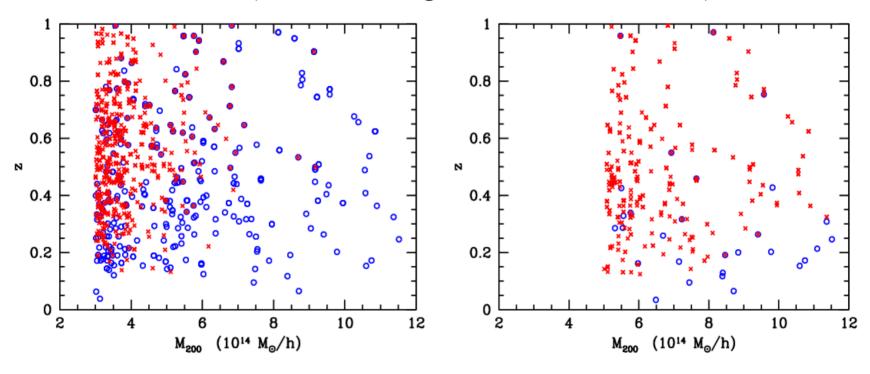


 $-100 \mu K$  to  $+100 \mu K$ 

 $\Delta T(353) - \Delta T(217)$ 

# Planck should detect massive clusters over the whole sky!

(Just searching for local maxima ...)

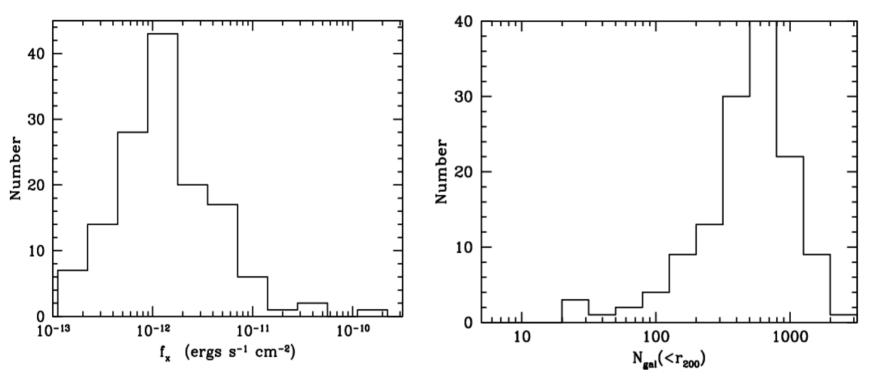


Hi frequency channels, foregrounds under control.

Lower frequency channels, avoid dust and sources.

### A great sample for followup!

(All good weak lensing candidates: typically S/N>10)



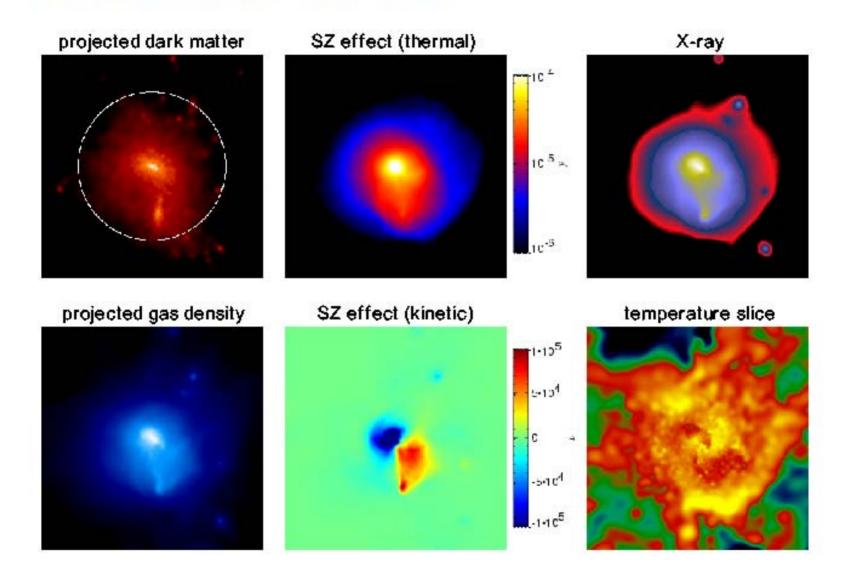
X-ray flux distribution peaks at 10<sup>-12</sup> ergs/s/cm<sup>2</sup>

Number of galaxies (R<25) within  $r_{200}$ 

Number of clusters over 1000 sq. deg.

## Combined measurements of X-ray, and thermal & kinetic SZ are powerful tools to study the structure of clusters

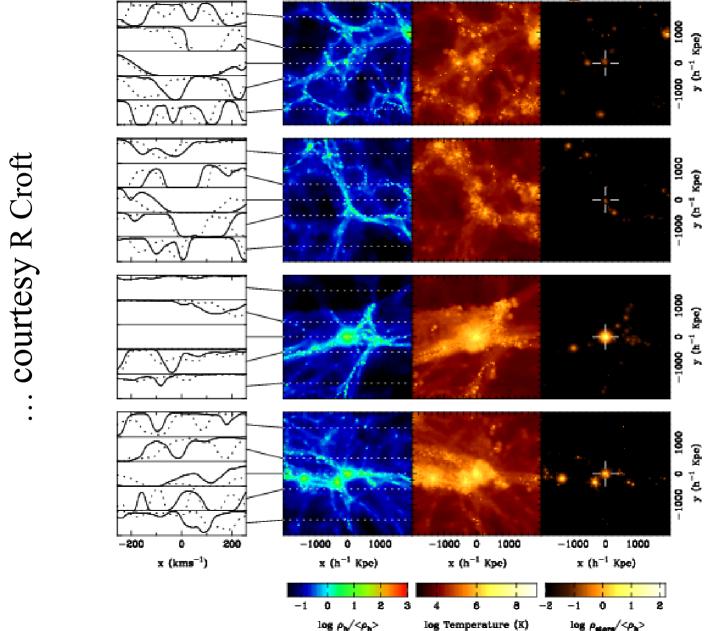
#### A CLUSTER SEEN IN DIFFERENT WAYS



### Adding physics ...

- To model galaxy formation or the intergalactic medium we need to include (radiative) cooling for the gas.
- Without feedback there is a cooling "catastrophe".
- Star formation, galactic winds and supernovae return kinetic and thermal energy to the gas
  - All sub-grid physics!
  - Parameterized models.

Small-scale structure: Ly-\alpha forest

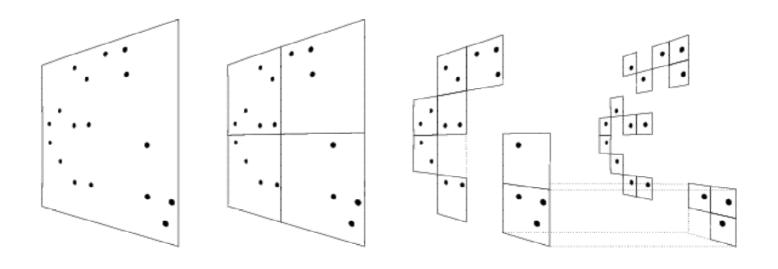


### Conclusions

- Codes to handle only gravity are well understood.
- Memory is the biggest limitation for pure N-body problems.
- Hydro codes are quite advanced, but significant algorithmic improvements are still occurring.
- All important feedback processes are still occurring through parameterized models.
- Radiative transfer is still in its infancy.

## STOP

### Tree codes



Force on distance collections can be computed using multipole expansion – stored in higher tree nodes.

Oct-tree, kd-tree, hash-tree ...